

The mean shift update now becomes

$$m_{y_k} = - \frac{\sum_i k' \cdot V_i}{\sum_i k'}$$

This is a tangent vector at  $y_k$

and then we form

$$y_{k+1} = \exp_{y_k} \left( m_{y_k} \right)$$

Notice

- in  $\mathbb{R}^n$ , this is just what we've used to
- for anything else, we need to be good at exp.

## Some examples:

- Lie groups.

(a Lie group is a group that is a differentiable manifold, where the group's action on itself  $G \times G \rightarrow G$  is differentiable; they have lots of interesting properties; all our usual matrix groups are Lie groups)

- assume a matrix representation
- Define two MATRIX operators

$$e^M = \sum_{i=0}^{\infty} \frac{1}{i!} M^i$$

$$\log(M) = \sum_{i=1}^{\infty} \frac{(-1)^{i-1}}{i} (M - I_d)^i$$

You can verify that  $\log(e^M) = M$   
 $e^{\log M} = M$  etc.

These series may come with requirements on  $M$  for convergence!

One can now show (O'Neill, ch II) that

$$\exp_x(M) = x e^{[x^{-1} \cdot M]}$$

Matrix; a  
point on group

matrix tangent to group

if  $\exp_x(V) = y$  then

$$V = X \log [X^{-1}Y]$$

None of this is particularly attractive; but in special cases, we can do things

eg:  $SO(3)$  (3D rotations)

notice: if  $M(\phi)$  is  $\in SO(3)$

then  $M^T M = Id$

$$\text{so } M^T \nabla_{\phi} M + \nabla_{\phi} M^T M = 0$$

now consider tangents at origin,  $M = Id$

$$\nabla_{\phi} M + \nabla_{\phi} M^T = 0$$

We always work with the natural inner product on the matrix space

so if  $u, v$  are tangent vectors represented as matrices we use

$$\begin{aligned}\langle u, v \rangle &= \sum_{ij} u_{ij} v_{ij} \\ &= \text{Trace}(u^T v)\end{aligned}$$

So tangent space at origin consists of  $\mathbb{R}^3$  N s.t.  $N + N^T = 0$

write

$$[\omega]_x = \begin{bmatrix} 0 & -\omega_z & \omega_y \\ \omega_z & 0 & -\omega_x \\ -\omega_y & \omega_x & 0 \end{bmatrix}$$

(here  $\omega = [\omega_x, \omega_y, \omega_z]$  is axis of rotation,  $\|\omega\|$  is magnitude)

then

$$e^{[\omega]_x} = Id + \frac{\sin \|\omega\|}{\|\omega\|} [\omega]_x + \frac{(1 - \cos \|\omega\|)}{\|\omega\|^2} [\omega]_x^2$$

(called the Rodriguez formula - expand, and match terms w/ Taylor series)

It's also straightforward to extract axis angle from a rotation. Consider  $M \in SO(3)$

$$Mv = v \quad \text{if } v \text{ is } \underline{\text{axis}}$$

other two eigenvalues reveal angle;  
cf eigenvalues of 2D rotation.

$$\left( \lambda_1, \lambda_2 = e^{\pm i\theta} \right)$$

This seems to work rather well for clustering pose.  
(Subbarao + Meer paper)

# Working on Grassmannians

(Earlier notes were a little sloppy;  
better here)

$$G_{N,p} = \left\{ \begin{array}{l} \text{space} \\ \text{Set of } p\text{-dimensional flats} \\ \text{through the origin in } \mathbb{R}^N \end{array} \right\}$$

(which is the same as  $p-1$  d flats in  $\left\{ \begin{array}{l} \mathbb{P}^{n-1} \end{array} \right\}$ )

Multiple representations available. We will  
parametrize with

$$[Y] = n \times p \text{ matrix}$$

$$\text{st } Y^T Y = I_d.$$



Notice that multiple  $Y$ 's can represent the same point on the Grassmannian

- If  $M_{p \times p}$  is  $p \times p$  rotation

$$M^T M = Id$$

then  $YM$  represents the same point

### Interpretation

- $p$  orthogonal basis for vectors for the space we wish to rep'n

- $M_{p \times p}$ , right action is a rotation of that basis w/in that space.

## Tangent vectors:

• Easy argument (there's a harder argument in Edelman).

want  $\Delta$  st.

$$(Y + \epsilon \Delta)^T (Y + \epsilon \Delta) = I_d$$

to first order.

so

$$Y^T \Delta = 0$$

$\uparrow$   
 $n \times p$

Tangent space is  $p(n-p)$  dimensional,  
 as it should be.

Metric

$$\langle \Delta, \Gamma \rangle = \text{tr}(\Delta^T \Gamma) \quad \text{as before.}$$

Then, there is a parametric form for  $\exp$

$$\exp_y(H) = [YV \cdot U] \begin{pmatrix} \cos \Sigma \\ \sin \Sigma \end{pmatrix} V^T$$

Where  $U \Sigma V^T$  is SVD of  $H$ .

Proof: Edelman, p15, easy!

AND

if

$$M = \exp_y(H)$$

$$H = A \sin^{-1}(S) B^T$$

where

$$A S D^T = M - Y Y^T M$$

$$B C D^T = Y^T M$$

$$C^T C + S^T S = I_d$$

$S, C$  diagonal.

(Subbarao + Meer - Haven't checked this!)